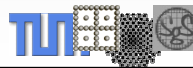


Numerical Treatment of PDE

- here: restriction to the elliptic case, Poisson equation
- several principal approaches:
 - **finite differences (FD)**: direct approximation of each derivative (cf. ODE)
 - **finite volumes (FV)**: direct implementation of conservation laws on small volumes; esp. for flows
 - **finite elements (FEM)**: variational approach, study some weak form of the PDE
- rough characterization:
 - **FD**: straightforward, easy to implement, poor theoretical background
 - **FEM**: more complicated to implement, but rich mathematical theory available



Introduction to Scientific Computing
Lesson 7: Discretizing PDE



Slide 1

Finite Difference Methods 1

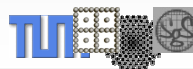
- Place a (in general regular) grid on the given domain.
- Replace derivatives by difference quotients:
 - first derivatives: **forward**, **backward**, or **central** differences

$$\frac{\partial u}{\partial x}(\xi) \doteq \frac{u(\xi + h_x) - u(\xi)}{h_x}, \frac{u(\xi) - u(\xi - h_x)}{h_x}, \frac{u(\xi + h_x) - u(\xi - h_x)}{2h_x}$$
 - second derivatives: standard **3-point-stencil**

$$\frac{\partial^2 u}{\partial x^2} \doteq \frac{u(\xi + h_x) - 2u(\xi) + u(\xi - h_x)}{h_x^2}$$
 - Laplacian in 2D or 3D, resp: 5-point or 7-point stencil, resp.
- in each inner grid point: set up a *difference equation*
 - in each inner grid point: one *degree of freedom* per (scalar) unknown function
 - concrete equation near boundary depends on bound. cond.



Introduction to Scientific Computing
Lesson 7: Discretizing PDE



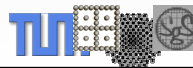
Slide 2

Finite Difference Methods 2

- a simple example: Poisson equation on unit square

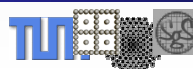
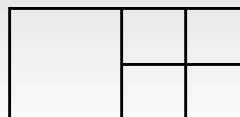
$$-\Delta u = f \quad \text{on }]0,1[^2$$

- use an equidistant square grid with $h = h_x = h_y = 1/N$
- number of d.o.f./unknowns: $M = (N-1)^2$
- linear system $Ax=b$ with
 - MxM-matrix A (the difference equations)
 - M-vectors b (right-hand side) and x (desired values of u)
- A is a *sparse matrix* (band structure):
 - **Dirichlet b.c.:** all diagonal elements are 4, per row between 2 and 4 non-zeroes (-1); boundary values to right-hand side
 - **Neumann b.c.:** diagonal elements are 2 or 3 near the boundary and 4 elsewhere; a corresponding number of -1's (2 to 4) in each row; pairs (1,-1) along boundary to r.h.s.



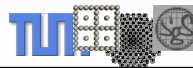
Finite Difference Methods 3

- order of accuracy: $\|u^{\text{computed}} - u^{\text{exact}}\| = O(h^2) = O(N^{-2})$
- *curse of dimension:* for that, we need $O(N^d)$ points
- possibilities of an improvement:
 - use higher-order stencils (involving more than two neighbouring grid points in each direction): matrix gets a denser structure
 - use a finer or a locally refined (*adaptive*) grid (problem: what to do with *hanging nodes* where coarser and finer subregions meet?)



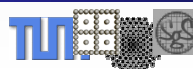
Finite Element Methods

- no direct discretization of derivatives, but use some *weak form* of the PDE instead of the PDE itself
- five basic steps:
 - **subdivision or grid generation:** decompose the underlying domain into single elements of finite size
 - **weak form:** the PDE has no longer to be fulfilled in each point of the domain, but only w.r.t. some scalar product
 - **finite dimensional ansatz space:** in the weak form, replace the continuous solution by suitable finite-dimensional approximations
 - **system of linear equations:** construct the corresponding system of linear equations (one equation for each degree of freedom)
 - **solution of the linear system:** use appropriate solvers in order to obtain the finite element approximation to the PDE's solution



Subdivision, Grid Generation

- subdivide the problem's domain into *finite elements*:
 - from statics/mechanics/civil eng.: decompose complex objects into standard parts whose behaviour is easier to describe, and derive the object's behaviour from that
 - in 3D, we get a finite element mesh consisting of
 - **elements:** 3D atoms (cubes, tetrahedra, ...)
 - **faces:** 2D surface structures of elements (triangles, squares,...)
 - **edges:** 1D boundary structures of elements
 - **grid points or nodes:** where the unknowns are defined
- associated to each grid point is an *ansatz function* φ_k
 - finite support: nonzero only in neighbouring elements
 - all ansatz functions together span the linear and finite-dimensional *ansatz space*, of which they form a basis
 - in this ansatz space V_n , look for an approximation to the PDE's solution



Weak Form of the PDE

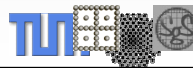
- let L denote the differential operator (e.g. Laplacian)
- instead of $Lu = f$ on Ω , consider

$$\int_{\Omega} Lu \cdot \psi_l \, d\Omega = \int_{\Omega} f \cdot \psi_l \, d\Omega \quad \forall \psi_l$$

for some set of *test functions* ψ_l

- method of **weighted residuals** or **Galerkin approach**
- a second finite-dimensional linear space spanned by these test functions – the *test space* W_n
- identical test and ansatz spaces: **Ritz-Galerkin approach**
- different test and ansatz spaces: **Petrov-Galerkin approach**
- due to linearity: require weak form for basis functions only
- introducing a *bilinear form* $a(.,.)$ and a *linear form* $b(.)$:

$$a(u, \psi_l) = b(\psi_l) \quad \forall \psi_l \in W_n$$



Discrete Approximation and Equations

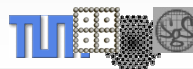
- In the above equation, replace the (exact/continuous) solution u by a discrete approximation in V_n :

$$u_n = \sum_k \alpha_k \phi_k$$

- in the weak form:

$$\begin{aligned} a(u_n, \psi_l) &= a\left(\sum_k \alpha_k \phi_k, \psi_l\right) \\ &= \sum_k \alpha_k \cdot a(\phi_k, \psi_l) = b(\psi_l) \quad \forall \psi_l \in W_n \end{aligned}$$

- neither the $a(.,.)$ nor the $b(.)$ depend on the respective approximation to u , but only on the problem!
- compute them once for all at the beginning: leads, as expected, to a system of linear equations $Ax=b$ with the so-called *stiffness matrix* A



Solving the Resulting SLE

➤ properties of A and of our system of linear equations:

- esp. in the Ritz-Galerkin case $V_n = W_n$, A is often SPD
- dream situation: A is diagonal, i.e. all ansatz/test functions are (bi-) orthogonal (rare or hard to achieve, resp.!))
- due to the ansatz/test functions' finite support, A is typically *sparse* (due to this and due to A's size in practical computations, we need iterative solvers):

$$a_{i,j} = a(\varphi_i, \varphi_j) = \int_{\Omega} L \varphi_i \cdot \varphi_j \, d\Omega = 0$$

for non-overlapping supports!

➤ strategy hence:

- choose ansatz/test spaces with good approximation properties
- construct bases of these which result in „nice“ matrices and, thus, in „fast-to-solve“ SLE (cf. *hierarchical bases*)

